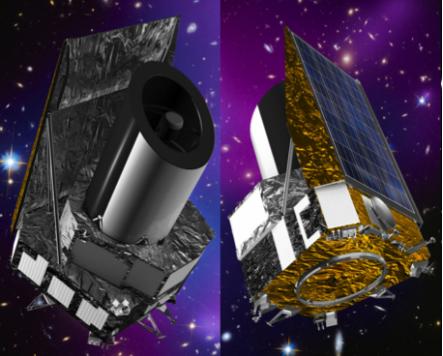


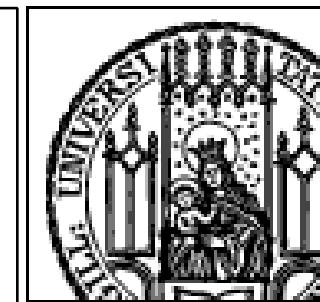
Data pipelines for Euclid



Martin Kümmel
mkuemmel@usm.lmu.de



**Faculty of Physics
Chair for Cosmology and
Structure Formation**



Outline

- Euclid:
 - Who / Why / What?
- The Euclid Science Ground Segment:
 - Structure: OU's, SDC's, SWG's
- What pipelines exist?
- A pipeline example: MER PF
- Hardware and IT
- Science Challenges

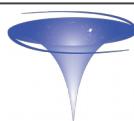


- 16 countries (14 European + USA + Canada);
- 225 institutes/labs (astrophysics, cosmology, theoretical physics, high energy, particle physics and space science);
- 1545 full members (>900 researchers);
- Long term project (already 200 alumni)
- Yearly Euclid Mission Conference with ~400 participants;
- EC is likely the largest existing astronomy consortium!



Why: Science Goals of Euclid

- Determine the expansion of the Universe at various cosmic ages;
- Understand the nature of the expanding Universe;
- Explore the nature and properties of dark energy, dark matter and gravity
- **Two experiments:**
 - **Weak lensing analysis (Baryonic Acoustic Oscillations);**
 - **Galaxy clustering (Redshift Space Distortion);**
- Redshifts are required:
 - From NISP slitless spectroscopy;
 - From photo-z;
- (Legacy science);



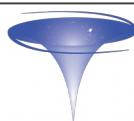
What: Euclid project

- Project to achieve some science goals;
- Reaching the science goal needs massive data reduction;
- Lots of data is necessary;
- Data comes from:
 - Ground based surveys (EXternal data);
 - The Euclid satellite;
- Euclid satellite is central to the project;

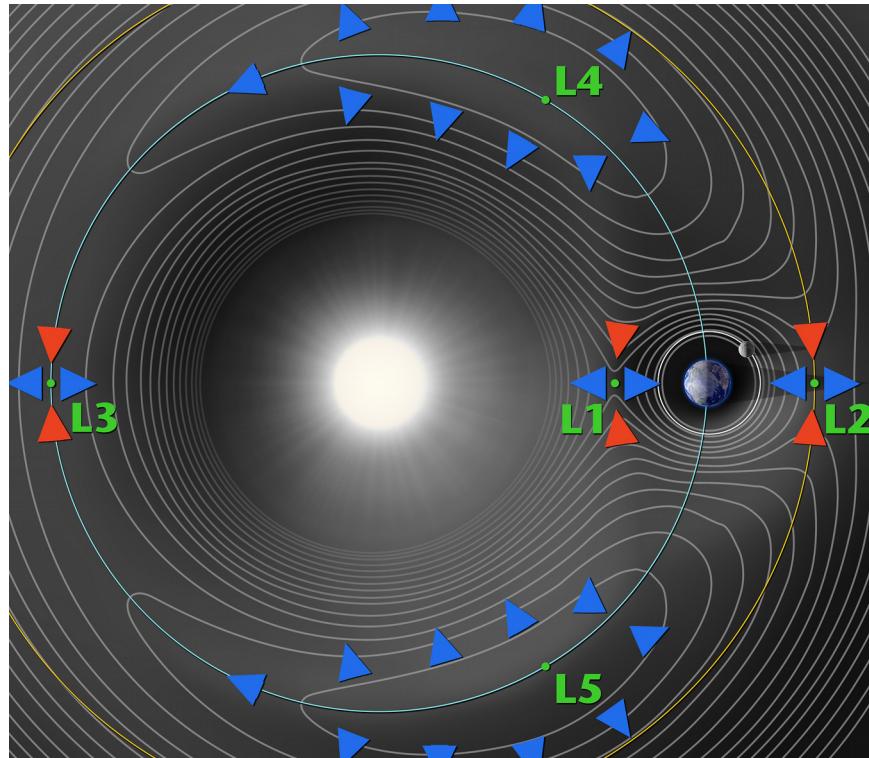


Telescope	1.2m Korsch, 3 mirror anastigmat., f=24.5m				
Instrument	VIS	NISP			
Field-of-View	0.787x0.709 deg ²	0.763x0.722 deg ²			
Capability	Visual Imaging	NIR Imaging Photometry			NIR Spectroscopy
Wavelength range	550-900 nm	Y	J	H	1100-2000 nm
Detector Technology	36 arrays 4k x 4k CCD	16 arrays 2k x 2k NIR sensitive HgCdTe detectors			
Pixel Size/FWHM	0.1" / 0.2"	0.3 " / 0.3"			0.3 "/
Spectr. Res.	-	-			R=250

Launch: June 2022
Then: travel to L2



Euclid at L2



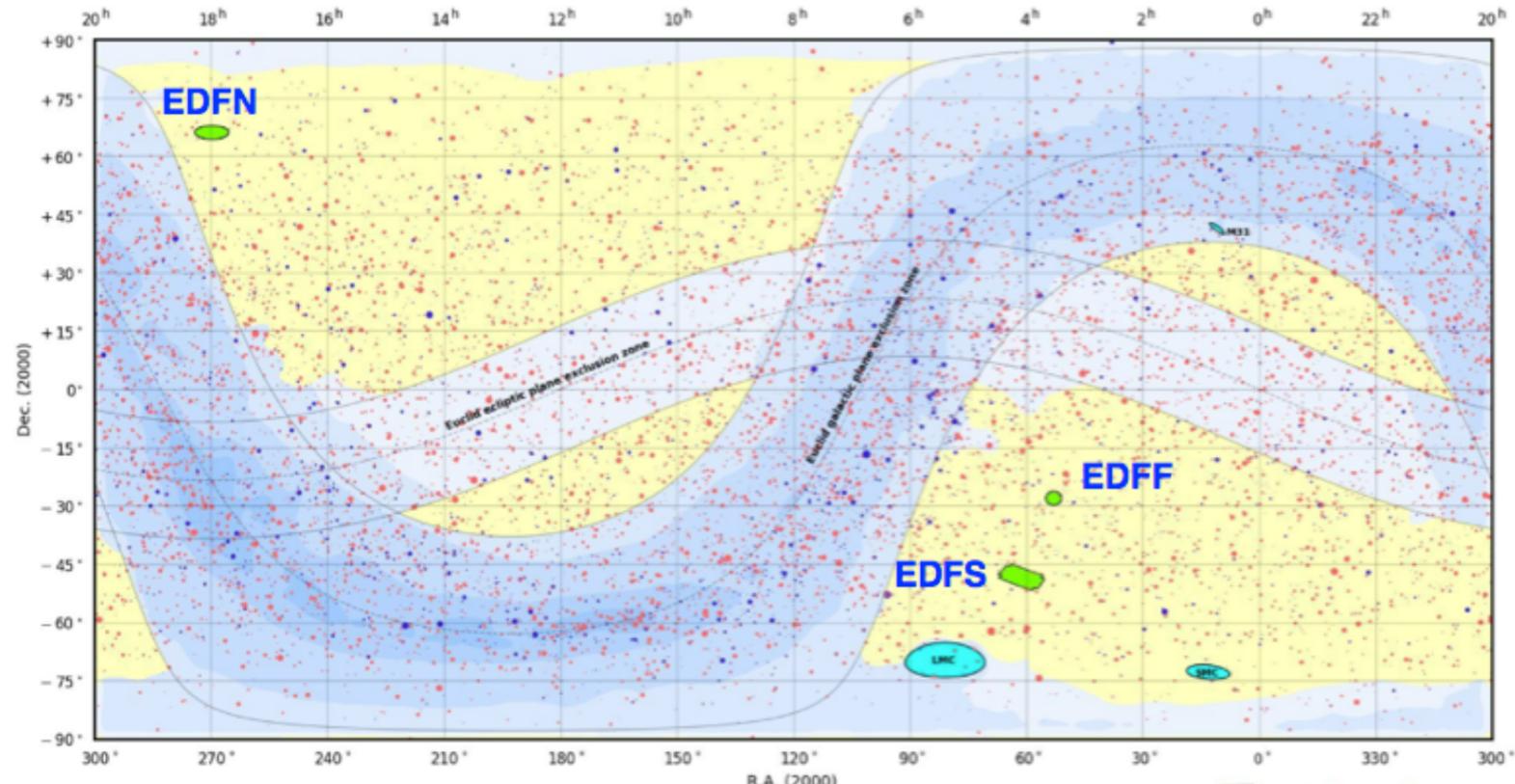
- L2 Sun-Earth Lagrangian point;
- Unstable → orbit;
- Propellant necessary → limited lifetime;
- **6 year nominal lifetime;**



Euclid Survey(s)

- Wide Survey:
 - 15,000 deg² (we are running out of sky...)
 - Survey specs:
 - VIS: 24.5 mag (10σ)
 - Y/J/H: 24.0 mag (5σ)
 - $g/r/i/z = 25.2/24.8/24.0/24.0$ mag (10σ)
 - Spectroscopy down to 3×10^{-16} erg cm⁻²s⁻¹
- Deep Survey:
 - 40deg²: (EDF-North and EDF-South):
 - 10 deg² EDF-North (NEP);
 - 20 deg² EDF-South (Stadion);
 - 10 deg² EDF-Fornax;
 - Survey specs:
 - VIS: 26.5 mag (10σ)
 - Y/J/H: 26.0 mag (5σ)
 - $g/r/i/z = 27.2/26.8/26.0/26.0$ mag (10σ)
- NIR self-calibration field;
- Photo-z calibration field;





Euclid Foregrounds (4/8): bright stars from the visible to the near-infrared

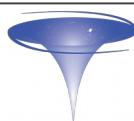
Yellow: Euclid Wide Survey : 15,000 deg² [with $E(B-V) < 0.08$, up to 0.15 to avoid holes&islands]

Light blue: Euclid exclusion zone : 26,000 deg² [galactic+ecliptic planes + reddening]

Green: Euclid Deep Fields : North=10 deg², Fornax=10 deg², South=20 deg²

g or H magnitude (AB): ● 2 ● 0 ■ 2 □ 4 △ 6
 ● All 8000 brightest stars in the sky up to g-band = 6.5
 ● All 8000 brightest stars in the sky up to H-band = 6.8
 g-band: Yale Bright Star Catalog (Hoffleit & Warren 1991)
 H-band: The Two Micron All Sky Survey (2MASS, Skrutskie et al. 2006)

Jean-Charles Cuillandre



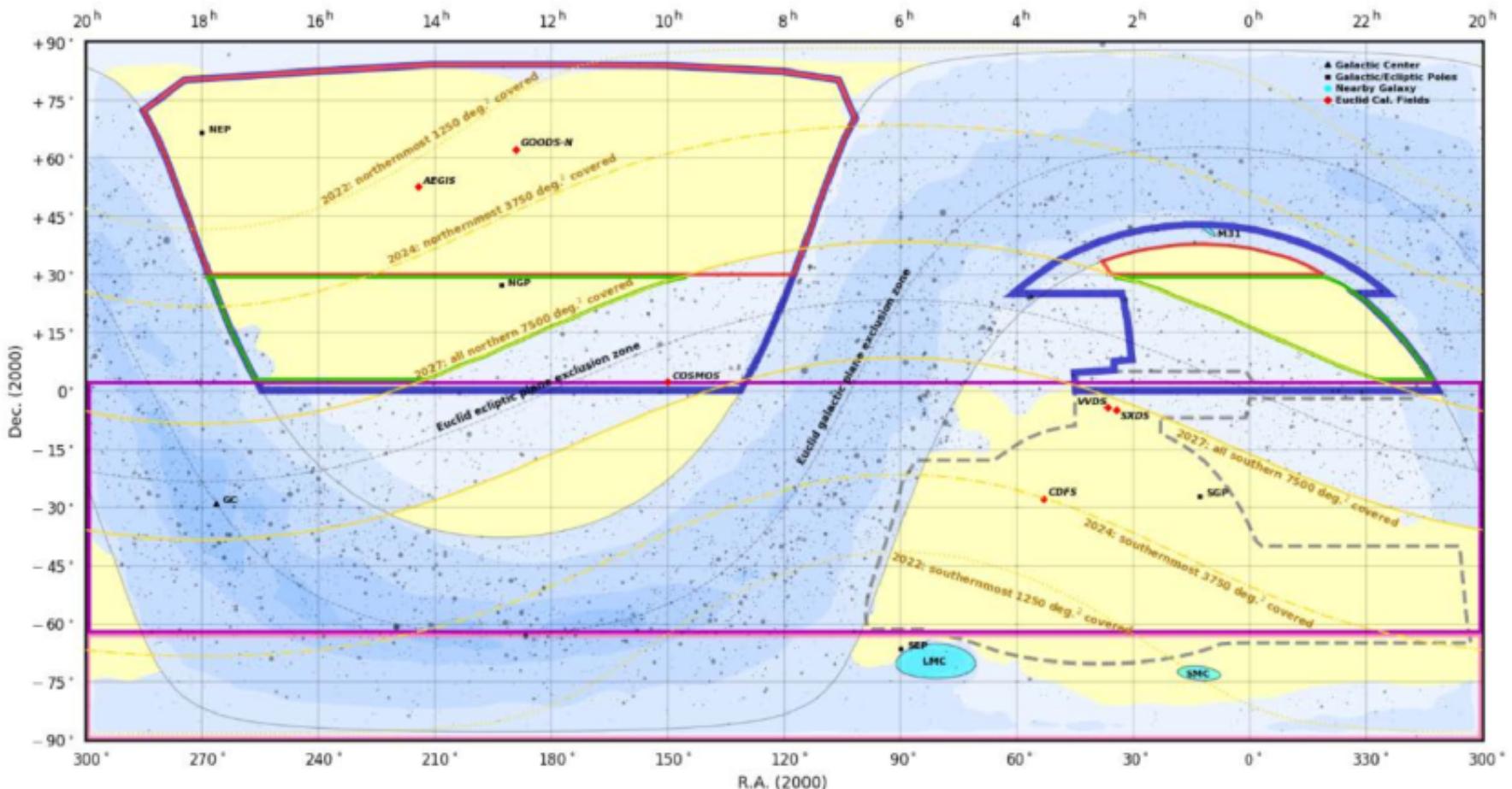
External Surveys: photometric

- Dark Energy Survey (**DES**): *griz*, south;
- Kilo Degree Survey (**KiDS**): *ugriz*, south;
- CFHT survey **CFIS**: *ur*, north
- **JPAS** survey: *g*, north;
- **PAN-STARRS 1 / 2**: *iz*, north;
- **LSST**: *griz*, south and north (special extension);

For photometric redshifts!



External Surveys: photometric



Expected ground-based coverage of the Euclid Wide Survey DR2/DR3 (2026/2029) (origin/bands/overlap)

- Euclid Wide Survey : 15,000 deg² [with E(B-V) < 0.08]
- Euclid exclusion zone : 26,000 deg² [galactic+ecliptic planes]
- Ecliptic isolines track the space survey started at the ecliptic poles
- DES-griz : 4500 deg²
- CFIS-u : 7300 deg²
- CFIS-r/JEDIS-g/Pan-STARRS-iz : 4800 deg²
- LSST main survey, ugriz : 7000 deg²
- LSST south extension, ugriz : 1000 deg²
- LSST north extension, griz : 3000 deg²

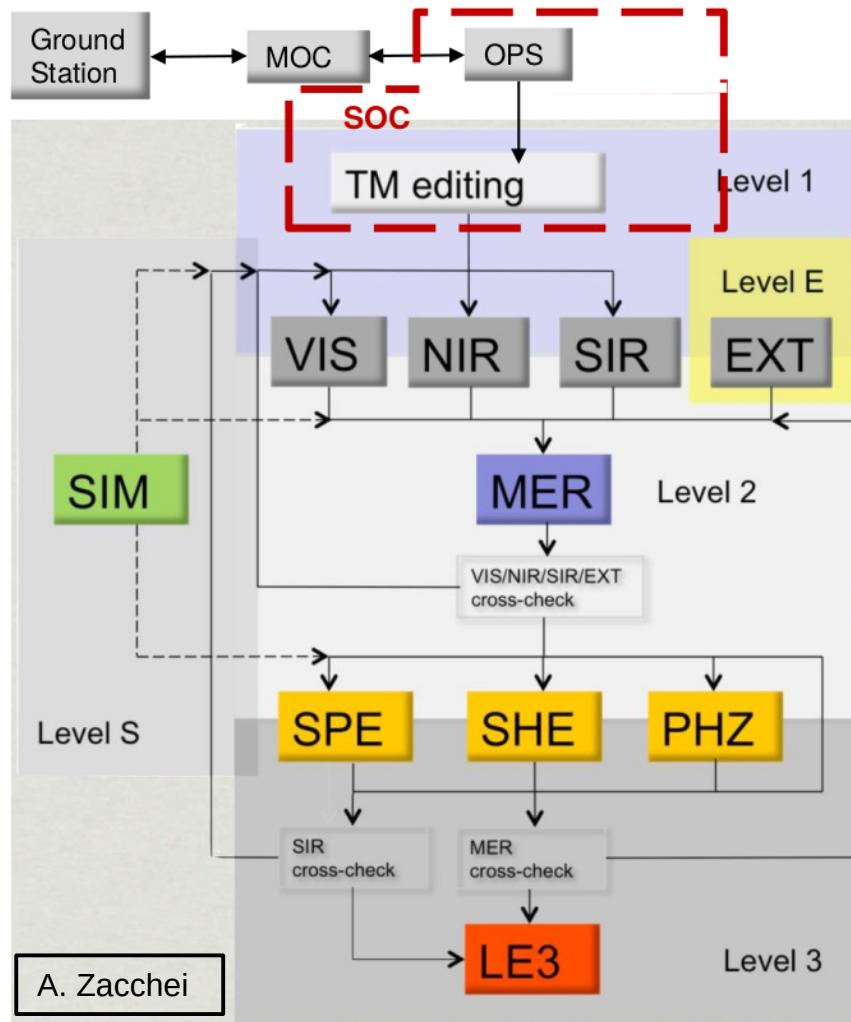


Science Ground Segment (SGS)

- Organizational Units (OU's):
 - Find data reduction methods;
 - Develop (at least) prototype code;
 - Design and implement the Processing Function (→ Data Pipeline);
- Science Data Centers (SDC's):
 - Euclidize the Data Pipelines;
 - Optimize software to production level;
 - Run the Pipeline Functions;
- Science Working Groups (SWG's):
 - Cover Weak Lensing/Cluster/Galaxy Clustering/Strong Lensing/Cosmology
 - Set the requirements for the data reduction;
 - Do the scientific analysis;
 - Write papers;
- Euclid Archive System (EAS):
 - Hosts the data and metadata;
 - Controls the processing;
 - Data delivery;



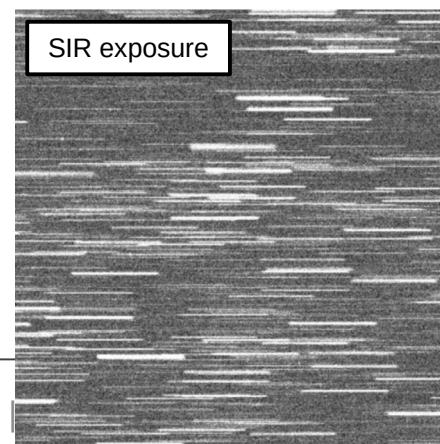
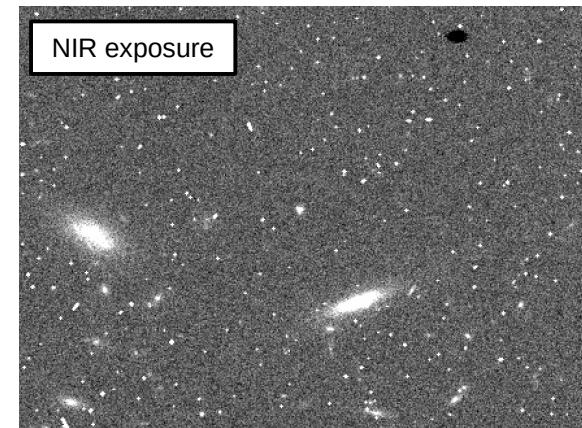
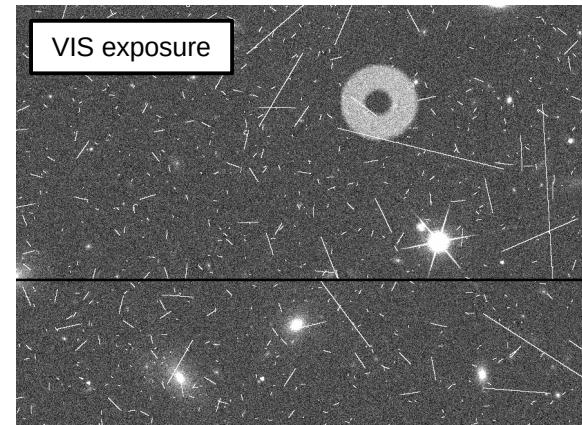
OU-PF → Euclid PF



- * VIS, NIR, EXT: production of fully calibrated photometric exposures from Euclid and ground-based surveys
- * SIR: production of fully calibrated 1D spectra extracted from the NISP spectroscopic exposures.
- * MER: production of a source catalog containing consistent photometric and spectroscopic measurements.
- * PHZ: production of the photometric redshift for all catalogued sources.
- * SPE: production of spectroscopic redshifts for all sources with spectra.
- * SHE: measurements of galaxy shapes.
- * LE3: production of all high-level science products.
- * SIM: production of all the simulated data necessary to validate the data processing stages, and to calibrate observational or method biases.

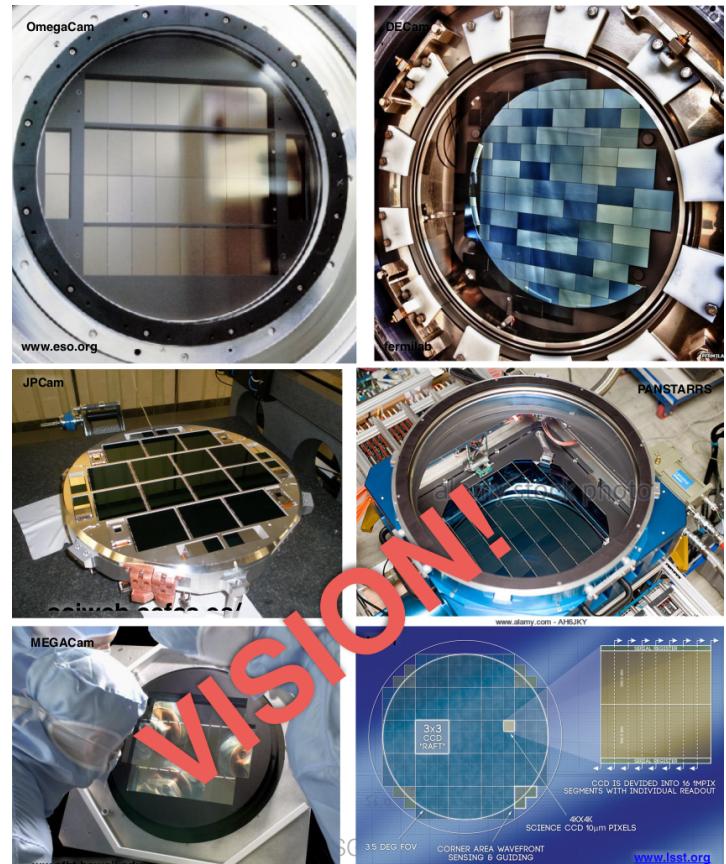
OU-VIS, OU-NIR, OU-SIR pipelines

- Instrument (Euclid) oriented OU's;
- Base task: production of fully calibrated pixel data!
- OU-VIS:
 - Cosmic-ray identification;
 - Determine the Point-Spread-Function (variable);
 - Ghost masking;
 - Correct the CTE (Charge Transfer Efficiency) effect!;
- OU-NIR:
 - Determine the Point-Spread-Function (variable);
 - Non-linear sensitivity;
 - Persistence!
- OU-SIR:
 - Instrumental effects as OU-NIR;
 - Slitless spectroscopy specific effects:
 - “Object finding”;
 - Contamination;
 - Spectral orders;



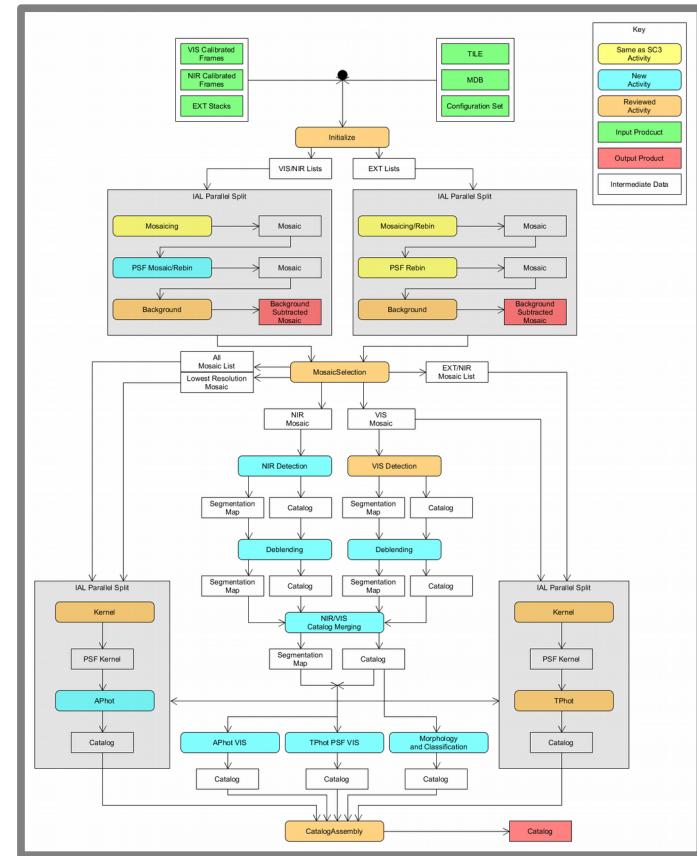
OU-EXT pipeline

- Data from DES, KiDS, CFIS, JPAS, PAN-STARRS, LSST;
- Survey oriented OU(s);
- Stage 1 pipeline:
 - Survey specific code!
 - May contain legacy code;
 - Generate fully calibrated science exposures!
- Stage 2 pipeline:
 - Identical for all surveys!
 - Exposures → output products;
 - Image co-addition;
 - Psf processing



OU-MER pipeline

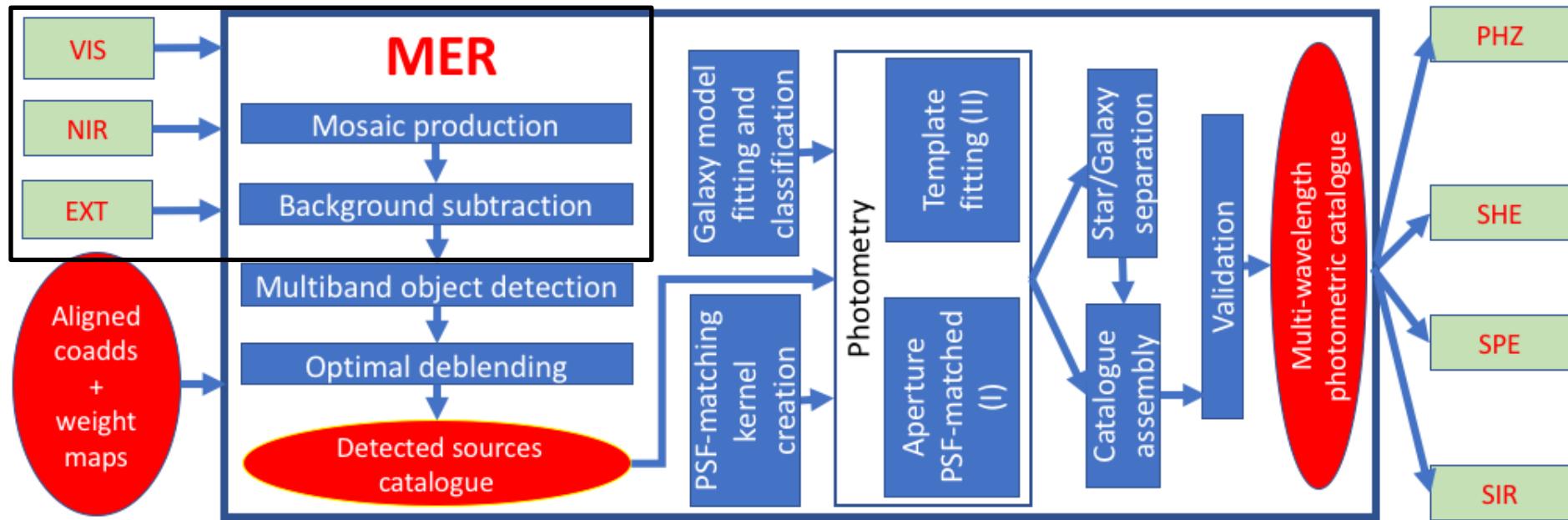
- Object detection;
- Photometry;
- Object classification;
- Object morphology;



Data flow diagram

The OU-MER pipeline

Euclid
Consortium

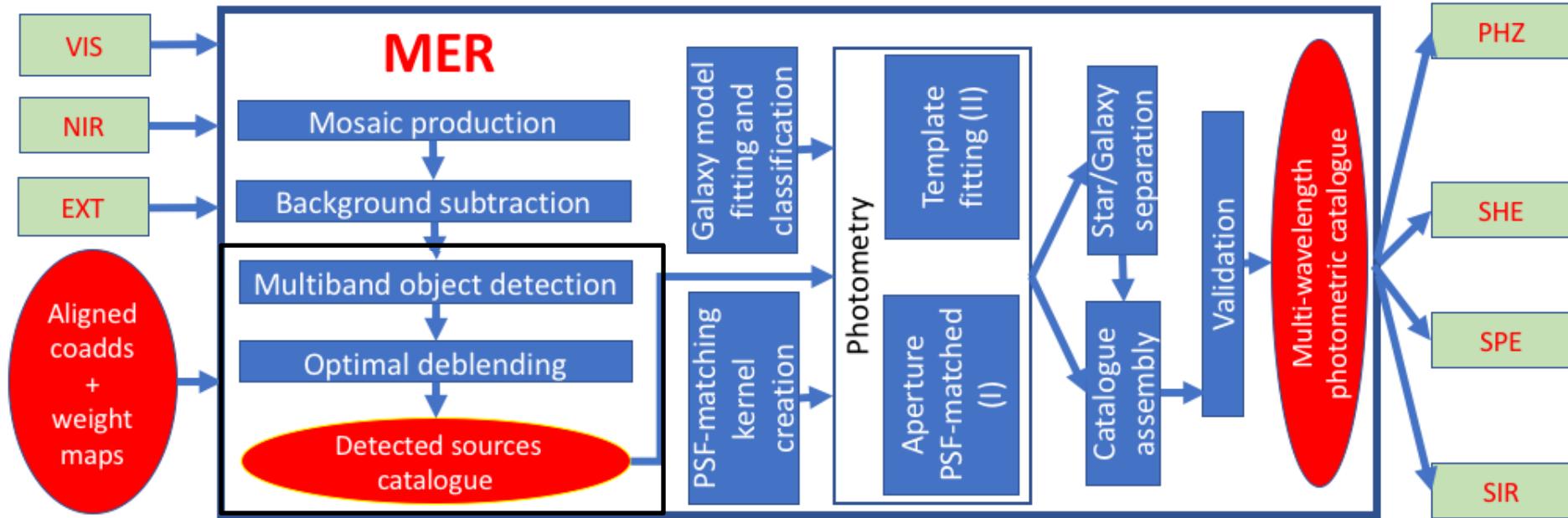


- **Mosaic production:** input images are combined in order to produce the final detection frame and appropriate measurement frames on pre-defined sky tiles;
- **Background subtraction:** any residual background is subtracted.

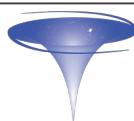


The OU-MER pipeline

Euclid
Consortium

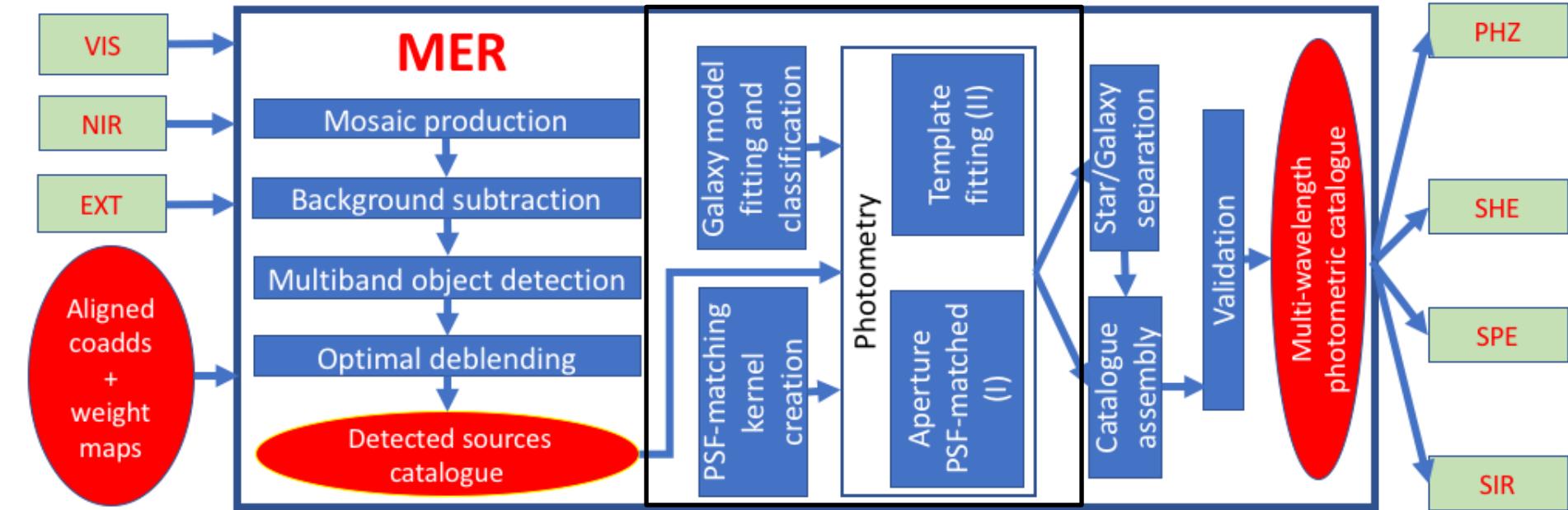


- **Detection:** all “significant” pixels of the VIS and NIR mosaic are individuated and flagged in segmentation map.
- **Deblending:** an algorithm is applied to separate blended sources and produce final VIS and NIR source lists and segmentation. Source lists are then combined.



The OU-MER pipeline

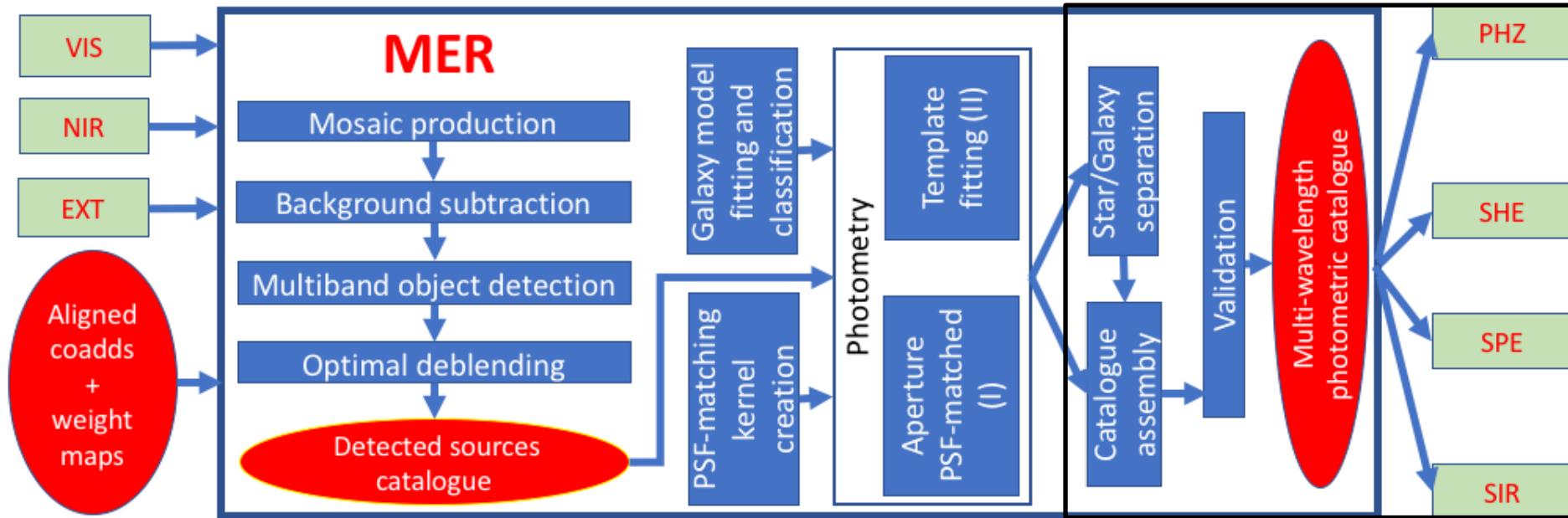
Euclid
Consortium



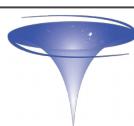
- **PSF matching:** convolution kernel to match the different PSFs are computed and all PSF-matched images needed are produced;
- **Photometry:** images are analysed by the photometric module(s) and a multiwavelength photometric catalogue of all sources is extracted.



The OU-MER pipeline

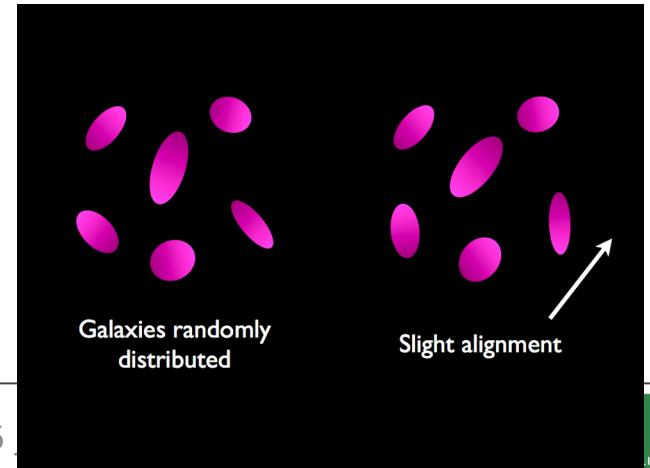
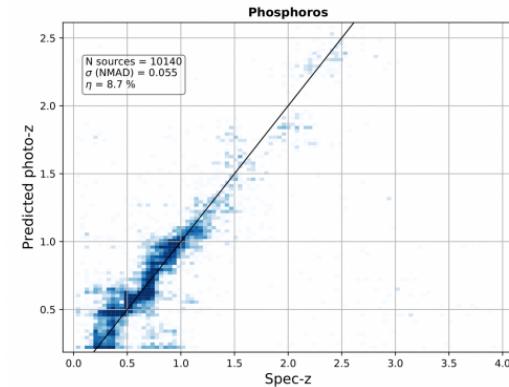


- **Morphological parameters** and other feature of the detected objects are computed, point-like and extended sources are separated.
- **Catalog Assembly** puts together all the information in the Euclid catalog and make final adjustments (unit conversion, unique ID assignment, etc.)

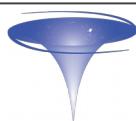


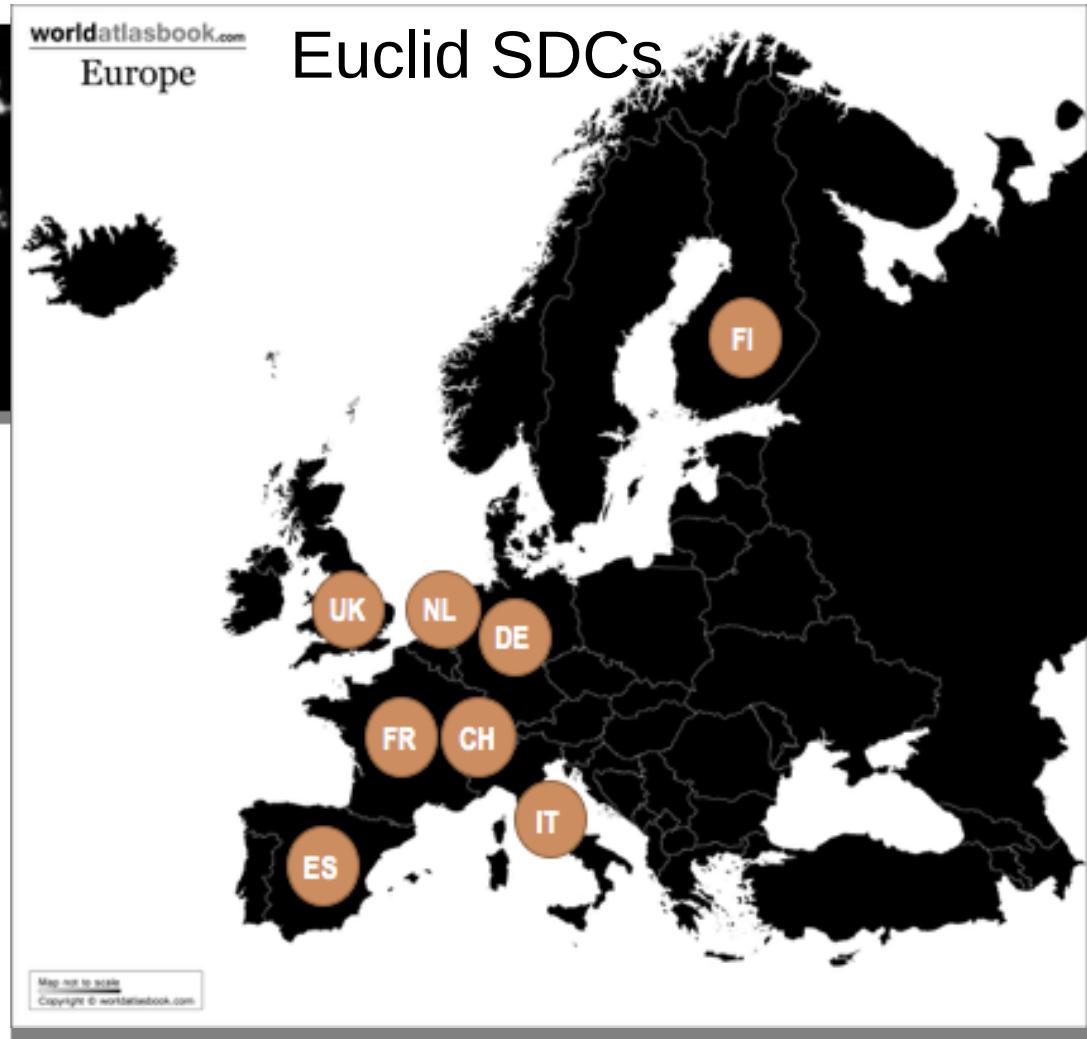
OU-SPE, OU-PHZ, OU-SHE pipelines

- “Science oriented” OU’s
- OU-SPE pipeline:
 - Takes the 1-d (slitless) spectra from SIR;
 - Determine the redshifts;
 - Identify and measure emission lines;
- OU-PHZ pipeline:
 - Takes the photometric information from MER;
 - Determines the photometric redshifts!
 - Strong requirements for accuracy and failure rate!
- OU-SHE pipeline:
 - Measures the morphology of (suitable) galaxies;
 - No suitable algorithm existed at project start!
 - Three competing algorithms!



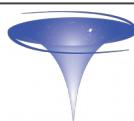
- 250 members: the largest OU!
- 47 define Processing Functions (→ Pipelines):
 - 12 with Priority 1 → Primary Core Science;
 - 4 with Priority 2 → Secondary Core Science (depending on available human resources);
 - 31 with Priority 3 / 4 → Related to Legacy Science (implemented if possible);
- Purpose of the Pipelines:
 - Preparation and characterization of various catalogs of objects;
 - Analysis of spatial distribution and weak lensing of galaxies;
 - Analysis of galaxy clusters;
 - Analysis of nearby galaxies and Milky Way objects;





Science Data Centers (cont.)

- Each major contributing country has one SDC;
- Different organizations (dedicated hardware, general computing center, ...)
- Classical server hardware;
- No GPU's (due to heterogeneity);
- Every SDC must be able to run every Euclid code (... except EXT legacy code);
- SDC-DE:
 - Part of the Max-Planck-Gesellschaft computing center;
 - Dedicated hardware;
 - 1st generation cluster with 648 cores already retired;
 - 2nd generation cluster with ~300 cores, 600 TB storage running;
 - During survey processing: 6000 cores;



- Processing:
 - In Virtual Machines (VM), CENTOS7 based;
 - Defined set of libraries available;
 - Latest VM with CVFMS (→ automatic upgrading);
 - Continuous software deployment;
- Software development:
 - C++11 and python3;
 - Few (non-C++/python3) legacy code;
 - CMake based build system;
 - Git/github;
 - Not many fundamental libraries;

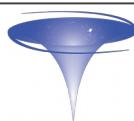


Science Challenges (SC)

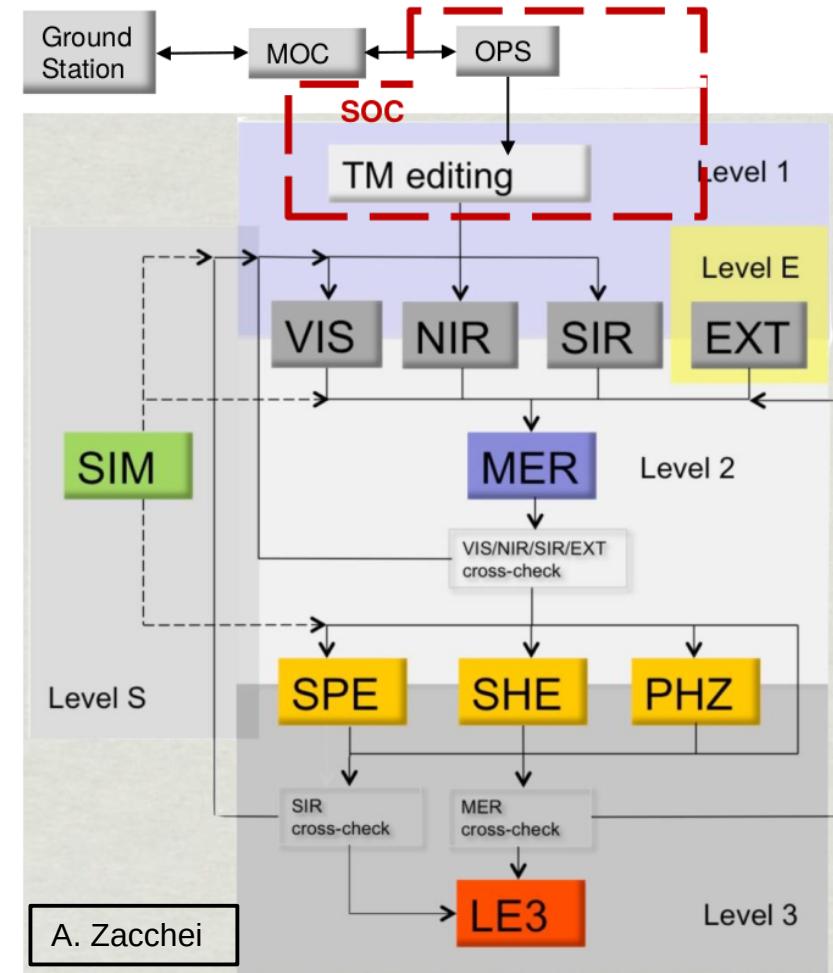
- Project started in 2011, first data comes 2023 → **What are we all doing?**
- **We use simulated data** (→ OU-SIM pipeline)!
- Science Challenge: pipelines reduce simulated data!
- Science Challenge runs in the production environment;
- Science Challenges sequence:
 - Increase in area;
 - Increase in processing depth;
 - Increase in level of detail;
- Goal: end-to-end processing over entire survey area!
- Central for pipeline validation and performance validation



- Simulations for all instruments:
 - VIS;
 - NIR (photometry and spectroscopy);
 - EXT (all flavours DES, KiDS, LSST, ...);
- **All** (CTE, persistence, PSF's+variability, ...) instrumental effects need to be simulated;
- Requires tons of input:
 - True universe from theoretical simulations;
 - Stellar model (for the Galactic stellar populations);
 - Galaxy and solar system input (extinction and sky background);
 - Model parameters for the various instrumental effects;
- The quality of the reduction pipelines depends on the quality of the simulation pipeline!

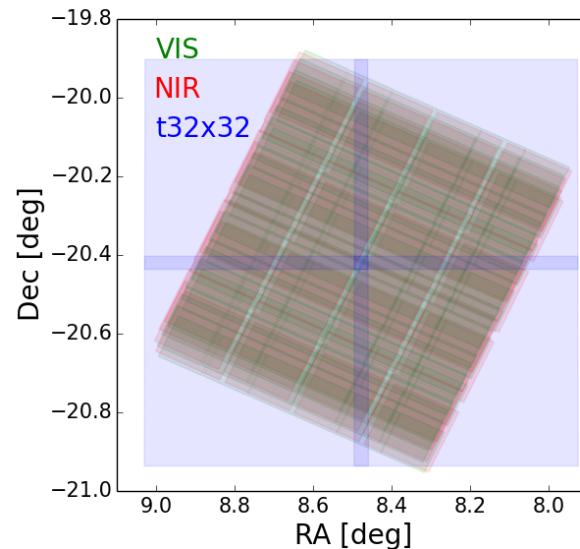


- SC1: SIM (VIS/NIR/SIR data)
- SC2: SIM1 + data model
- SC3: SC3 + VIS, NIR, SIR, EXT, MER
- SC4/5/6: SC3 + SPE, SHE, PHZ
- SC7: SC4/5/6 (all!) + partially LE3
- SC8: everything!



Science Challenge 3 data

- 1 Euclid FOV
- 4 pipeline fields
- Took more than 12 months!

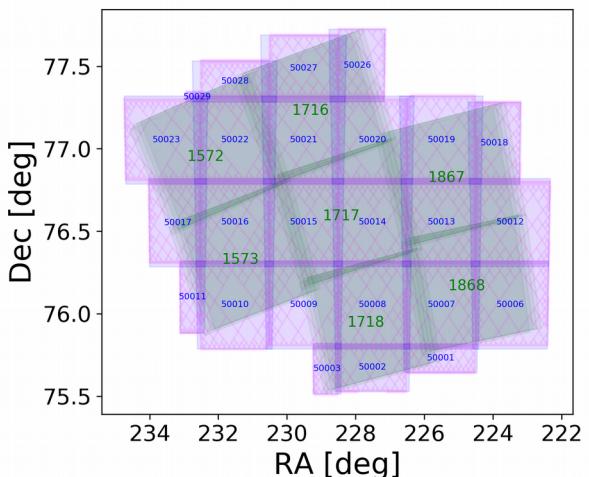
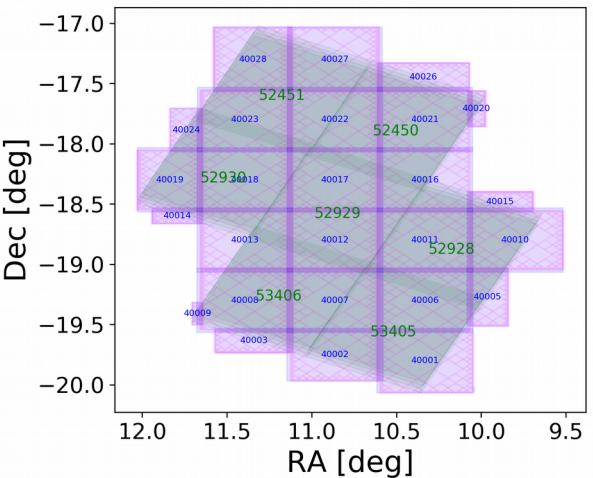
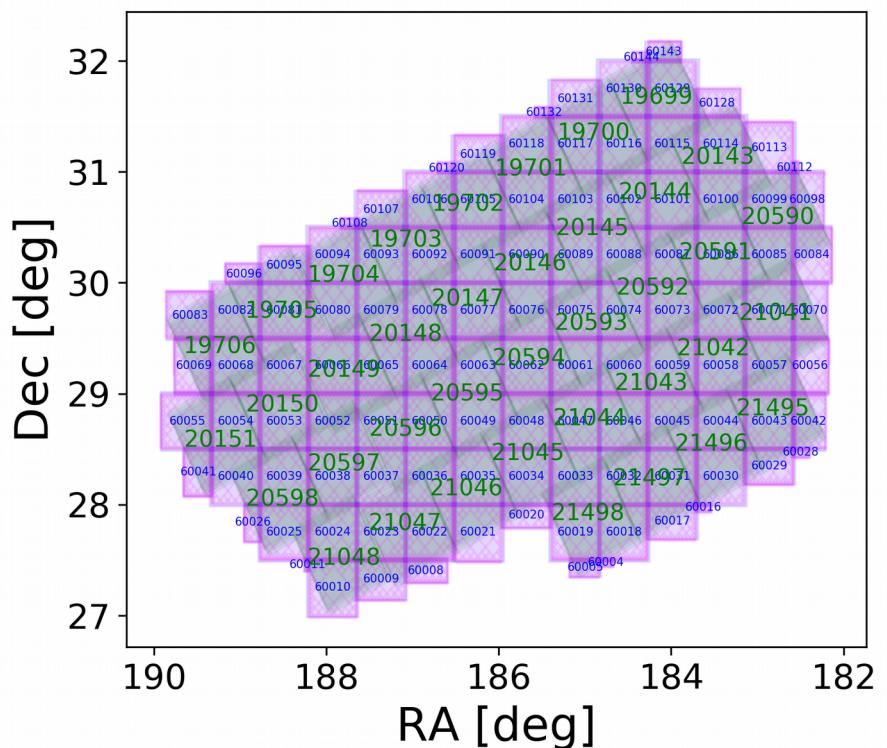


SC3 data



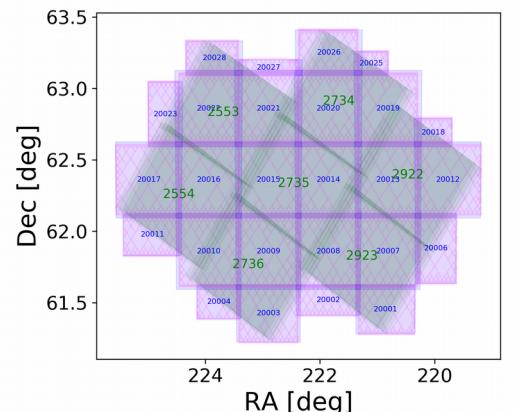
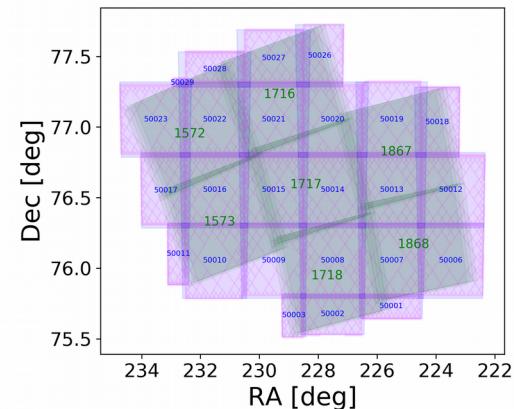
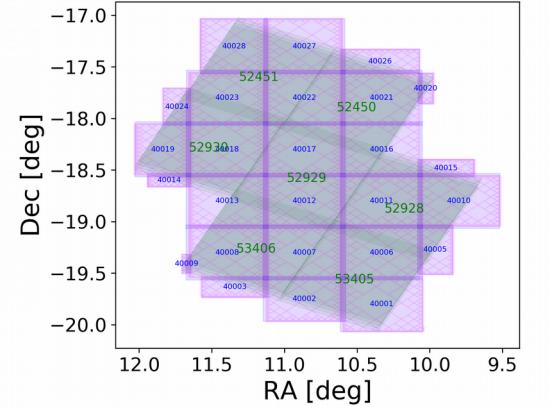
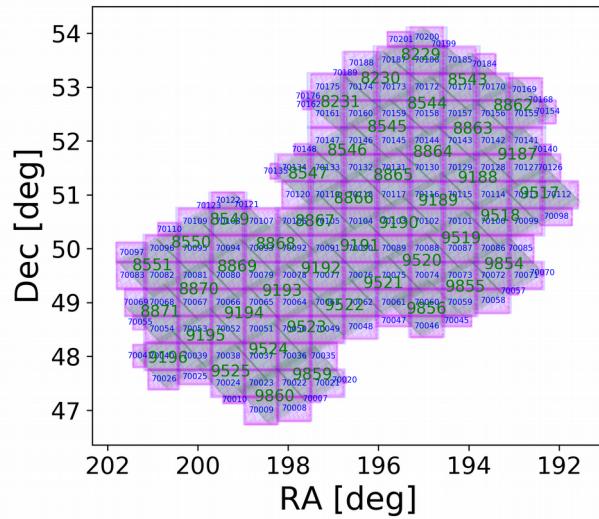
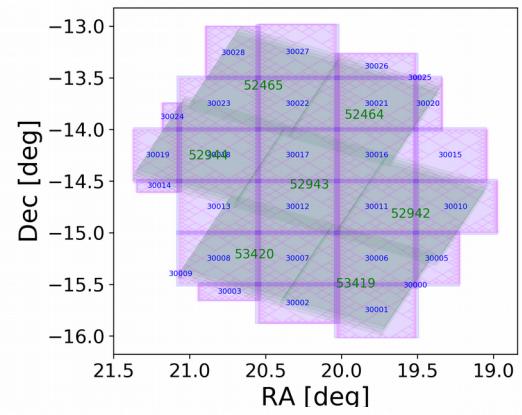
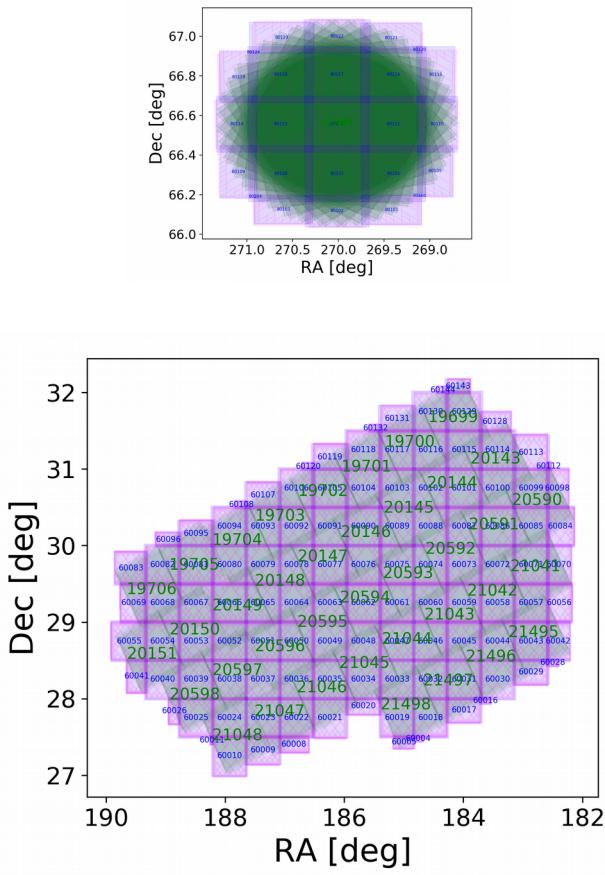
Science Challenge 4/5/6 data

- 60 Euclid FOV
 - ~150 pipeline fields
 - Took about 22 months!

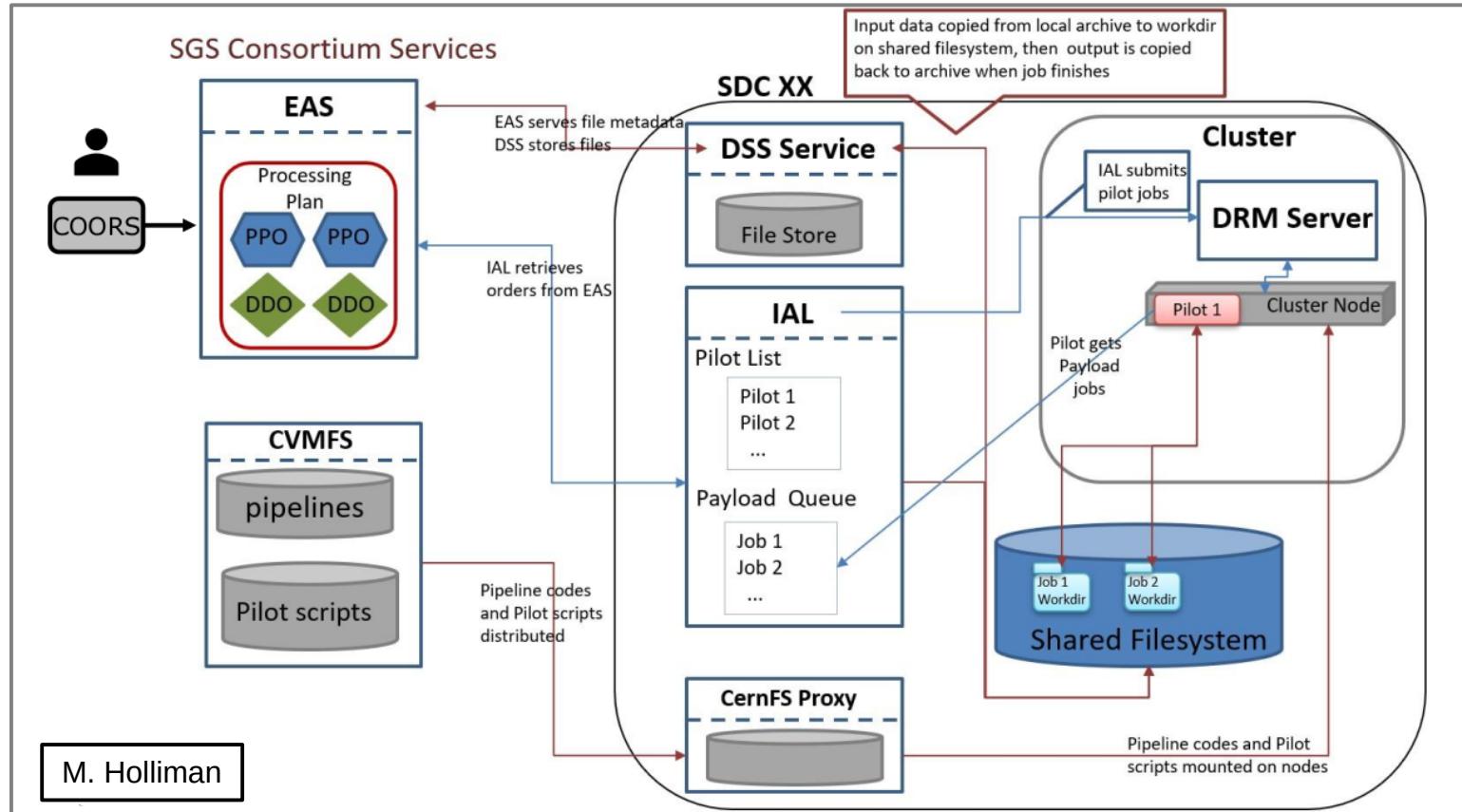


Science Challenge 7 data

- 120 Euclid FOV + Deep Field
- ~300 pipeline fields
- Time frame 3 months!



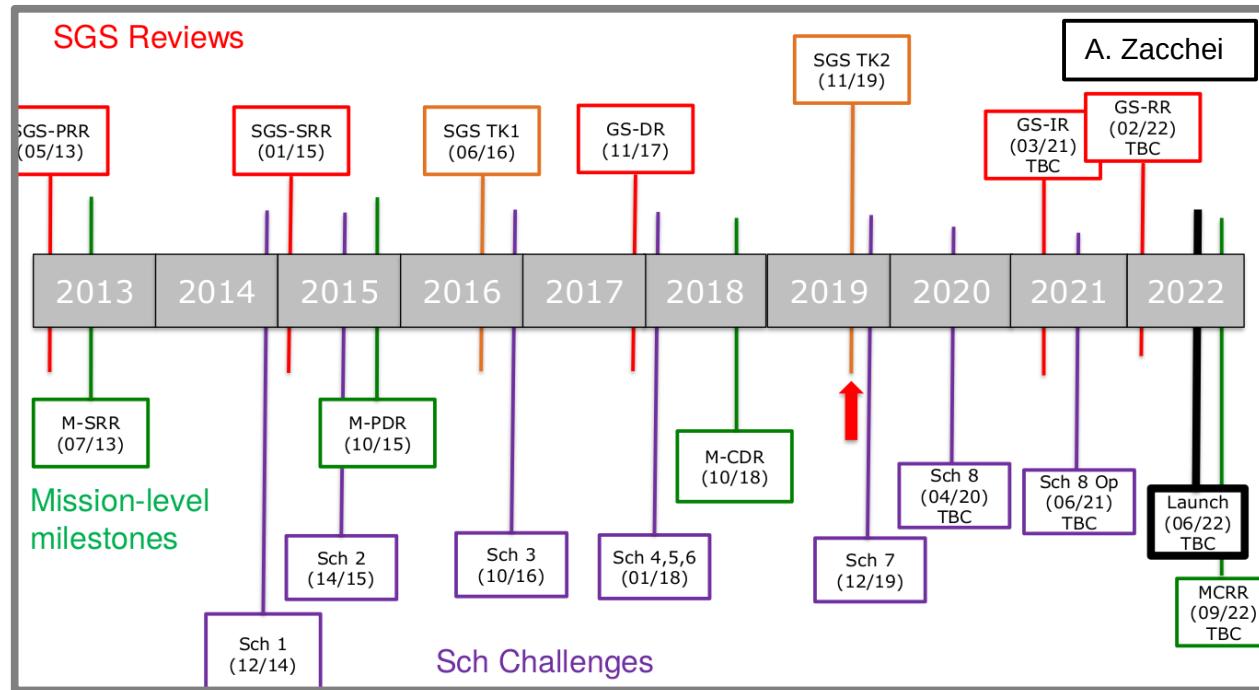
Pipeline infrastructure



Lessons learned (personal)

- 1) Interfaces (IT) matter!
- 2) Interfaces (sociological) matter!
- 3) Interfaces (background) matter!
- 4) Project management helps!
- 5) It is not “**only software**”!
- 6) People matter!

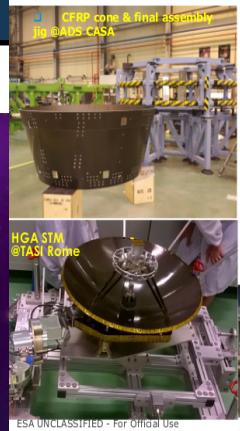
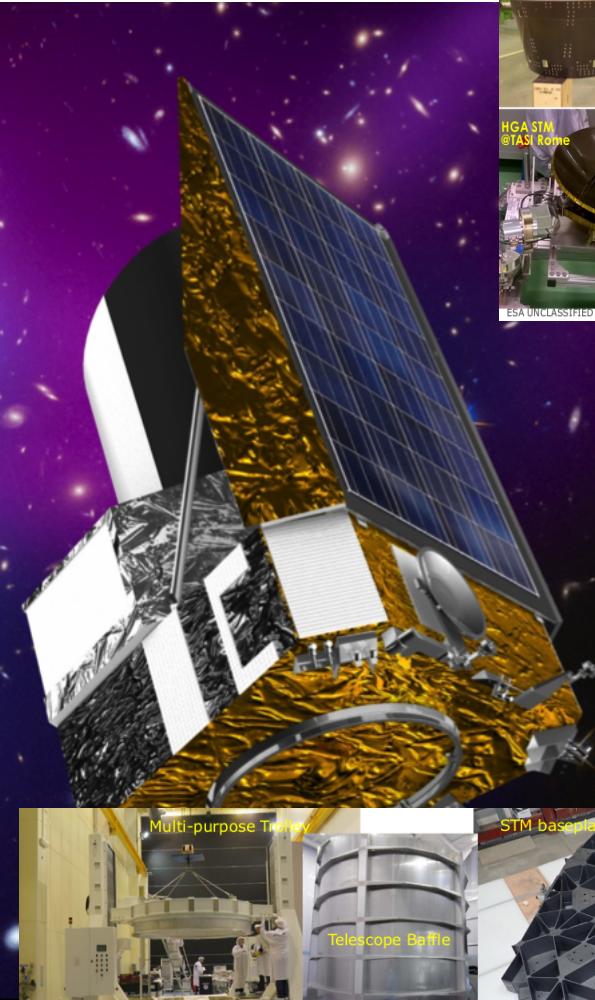




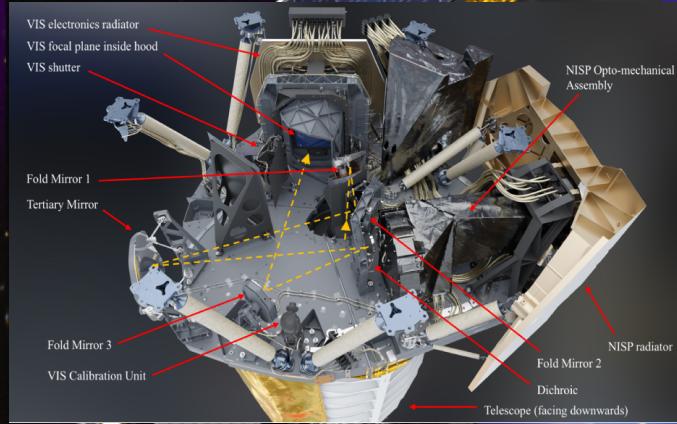
- The launch is approaching!
- Still lots of things to do!
- Data pipelines are in a reasonable state;
- Cautiously looking forward!



SVM Hardware



ESA UNCLASSIFIED - For Official Use



Further reading

- Euclid consortium page:
<https://www.euclid-ec.org/>
- Euclid@ESA:
 - <https://sci.esa.int/web/euclid>
 - http://www.esa.int/Science_Exploration/Space_Science/Euclid_overview



